## **Enhancing Reproducibility and Transparency of Research Findings**

107th Meeting of the Advisory Committee to the Director

December 5<sup>th</sup>, 2013

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Principal Deputy Director, NIH
Department of Health and Human Services





## **Background**

- Reproducibility and transparency of research findings have been noted as an issue in multiple publications.
  - This is a problem in all areas of research
  - This issue has been observed in both clinical and preclinical research, though NIH focus is preclinical research



### Beware the creeping cracks of bias

Evidence is mounting that research is riddled with systematic errors. Left unchecked, this could erode public trust, warns Daniel Sarewitz.

Believe it or not: how much can we rely on published data on potential drug targets?

Florian Prinz, Thomas Schlange and Khusru Asadullah

Statistical Design Considerations in Animal Studies

Published Recently in Cancer Research

Kenneth R. Hess

Raise standards for preclinical cancer research

C. Glenn Begley and Lee M. Ellis propose how methods, publications and incentives must change if patients are to benefit.

False-Positive Psychology: Undisclosed

Flexibility in Data Collection and Analysis

Allows Presenting Anything as Significant

### Why animal research needs to improve

Many of the studies that use animals to model human diseases are too small and too prone to bias to be trusted, says Malcolm Macleod.

Helping editors, peer reviewers and authors improve the clarity, completeness and transparency of reporting health research

David Moher\*1,2, Iveta Simera3, Kenneth F Schulz4, John Hoey5 and

Douglas G Altman<sup>3</sup>

Reforming Science: Methodological and Cultural Reforms

### Drug targets slip-sliding away

The starting point for many drug discovery programs is a published report on a new drug target. Assessing the reliability of such papers requires a nuanced view of the process of scientific discovery and publication.

#### Translating animal research into clinical benefit

Poor methodological standards in animal studies mean that positive results may not translate to the clinical domain

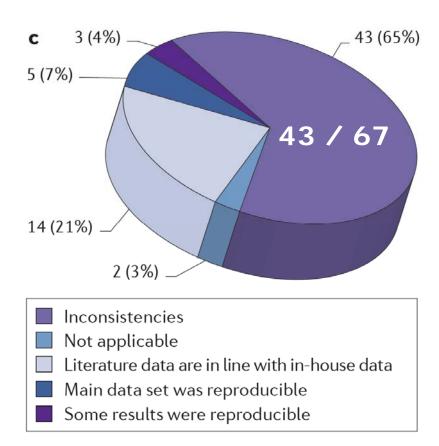
Courtesy of Dr. S. Silberberg, NINDS

## Almost 2/3 of 67 in-house projects could not replicate data published by others

Believe it or not: how much can we rely on published data on potential drug targets?

Prinz, Schlange and Asadullah

Bayer HealthCare



Nature Reviews Drug Discovery, 2011; 10:712-713

doi:10.1038/nature12831

## **ANALYSIS**

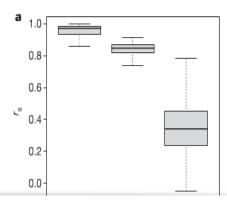
## Inconsistency in large pharmacogenomic studies

Benjamin Haibe-Kains<sup>1,2</sup>, Nehme El-Hachem<sup>1</sup>, Nicolai Juul Birkbak<sup>3</sup>, Andrew C. Jin<sup>4</sup>, Andrew H. Beck<sup>4\*</sup>, Hugo J. W. L. Aerts<sup>5,6,7\*</sup> & John Quackenbush<sup>5,8\*</sup>

Two large-scale pharmacogenomic studies were published recently in this journal. Genomic data are well correlated between studies; however, the measured drug response data are highly discordant. Although the source of inconsistencies remains uncertain, it has potential implications for using these outcome measures to assess gene-drug associations or select potential anticancer drugs on the basis of their reported results.

atients with cancer often exhibit heterogeneous responses to anticancer treatments, and evidence indicates that response is determined in part by patient-specific alterations in the somatic cancer genome and changes in gene expression. Cancer cell line studies have long been used to test the efficacy of therapeutic agents and to explore genomic factors associated with drug response. A number of studies have searched for gene expression signatures predictive of response; however, most only tested a limited number of genes, a small panel of drugs, or assayed drug response in a small number of cell lines.

Results from two large-scale pharmacogenomic studies—the Cancer



### Background (cont.)

- Relevant NIH workshops in 2012
  - NINDS: "Optimizing the Predictive Value of Preclinical Research", summarized in 11 October 2012 issue of *Nature* (Held in June)
  - NCI: Reproducibility and data standards (Held in September and December)
- NIH Leadership discusses underlying causes and the development of "pilot" interventions in 2013

## Possible causes in difficulties reproducing data

- Misconduct Falsification, Fabrication, or Plagiarism
  - In 2011, the Office of Research Integrity\*:
    - Received 240 allegations
    - Opened 12 as cases
  - Misconduct is one cause, but not the focus of this effort

## Possible causes in difficulties reproducing data

- Misconduct Falsification, Fabrication, or Plagiarism
- "Cartoon biology" overemphasis on the "exciting, big picture" finding sometimes results in publications leaving out necessary details of experiments performed



Contents lists available at SciVerse ScienceDirect

#### NeuroImage

journal homepage: www.elsevier.com/locate/ynimg



#### Full Length Articles

#### The secret lives of experiments: Methods reporting in the fMRI literature

#### Joshua Carp

University of Michigan, Department of Psychology, 530 Church Street, Ann Arbor, MI, 48109, USA

#### ARTICLE INFO

Article history: Accepted 3 July 2012 Available online 10 July 2012

Keywords: fMRI Methods reporting Reproducibility Experimental design Analysis methods Statistical power

#### ABSTRACT

Replication of research findings is critical to the progress of scientific understanding. Accordingly, most scientific journals require authors to report experimental procedures in sufficient detail for independent researchers to replicate their work. To what extent do research reports in the functional neuroimaging literature live up to this standard? The present study evaluated methods reporting and methodological choices across 241 recent fMRI articles. Many studies did not report critical methodological details with regard to experimental design, data acquisition, and analysis. Further, many studies were underpowered to detect any but the largest statistical effects. Finally, data collection and analysis methods were highly flexible across studies, with nearly as many unique analysis pipelines as there were studies in the sample. Because the rate of false positive results is thought to increase with the flexibility of experimental designs, the field of functional neuroimaging may be particularly vulnerable to false positives. In sum, the present study documented significant gaps in methods reporting among fMRI studies. Improved methodological descriptions in research reports would yield significant benefits for the field.

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- Chance Experiments performed correctly, but without appropriate replication
  - Difficulty in publication of "negative" findings

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- Poor experimental design fundamental quality characteristics not reported/performed (e.g. blinded assessment, randomization, sample size calculations)

# Insufficient reporting of methodological approaches is evident for pre-clinical studies

Table 3. Prevelence of selected quality characteristics in other experimental models

	Number of publications	Randomisation (%)	Blinded assessment of outcome (%)	Sample-size calculation (%)
Transgenic stroke studies	157	n/a	3	0
Stroke pathophysiology studies	166	5	18	0
Parkinson's disease	118	12	15	0
Multiple sclerosis	183	2	11	0

Trends Neurosci 2007; 30: 433-439

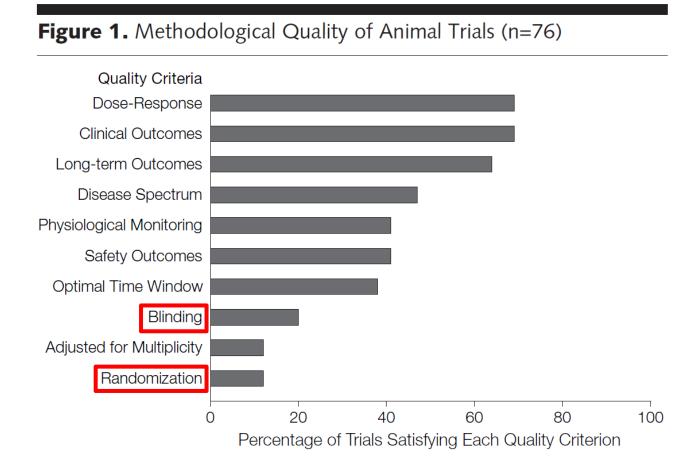
## Deficient reporting is widespread

#### Journals:

- Cell
- Nature
- Science
- Nature Medicine
- Nature Genetics
- Nature Immunology
- Nature Biotechnology

>500 citations

Translated to human studies



Hackam and Redelmeier, *JAMA* 2006; 14: 1731-1732

## Possible causes in difficulties reproducing data

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- Poor experimental design fundamental quality characteristics not reported/performed (e.g. blinded assessment, randomization, sample size calculations)
- Inadequate reporting of resources used



Scientific reproducibility has been at the forefront of many news stories and there exist numerous initiatives to help address this problem. We posit that a contributor is simply a lack of specificity that is required to enable adequate research reproducibility. In particular, the inability to uniquely identify research resources, such as antibodies and model organisms, makes it difficult or impossible to reproduce

sites. The results of this experiment show that 54% of resources are not uniquely identifiable in publications, regardless of domain, journal impact factor, or reporting requirements. For example, in many cases the organism strain in which the experiment was performed or antibody that was used could not be identified. Our results show that identifiability is a serious problem for reproducibility. Based on these

repositories (such as model organism databases, and the Antibody Registry), as well as vendor sites. The results of this experiment show that 54% of resources are not uniquely identifiable in publications, regardless of domain, journal impact factor, or reporting requirements. For example, in many cases the organism strain in which the experiment was performed or antibody that was used could not be identified. Our results show that identifiability is a serious problem for reproducibility. Based on these results, we provide recommendations to authors, reviewers, journal editors, vendors, and publishers. Scientific efficiency and reproducibility depend upon a research-wide improvement of this substantial problem in science today.





## Twenty tips for interpreting scientific claims

This list will help non-scientists to interrogate advisers and to grasp the limitations of evidence, say William J. Sutherland, David Spiegelhalter and Mark A. Burgman. alls for the closer integration of science in political decision-making have been commonplace for decades. However, there are serious problems in the application of science to policy — from energy to health and environment to education.

The suggestion to improve matters is to encourage more scientists to get involved in edition. Although healths, it is unrealistic to expect substantially increased political involvement from scientists. Another proposal is to expand the role of fold rickentific advisors,' increasing their number, availability and participation in political processes. Neither approach deals with the core problem of scientific ignorance among many who vote in parliaments.

Perhaps we could teach science to political interest of the second teach included in the second teach as a sufficient time? In practice, policy-makers almont never read scientific papers or books. The research relevant to choodrial replacement, bevine tuberculosis motion of the properties of the second teachers are t

In this context, we suggest that the immediate priority is to improve policy-makers understanding of the imperfect nature of science. The essential skills are to be about intelligently interrogate experts and advisers, and to understand the quality, limitations and biases of evidence. We term these interpretive scientific skills. These skills are more accessible than those required to understand the fundamental science itself, and can form part of the broad skill set of most politicians.

To this end, we suggest 20 concepts that should be part of the education of civil servants, politicals, policy advisers and journalists — and anyone else who may have to interact with science or scientists. Politicians with a healthy scepticism of scientific advocates might simply prefer to arm themselves with this critical set of knowledge.

We are not so naive as to believe that improved policy decisions will automatically follow. We are fully aware that scientific judgement titled in such laden, and that bias and context are integral to how data are collected and interpreted. What we offer it a simple list of ideas that could help decision—makers to parse how evidence can contribute to a decision, and potentially to avoid undue influence by those with vested interests. The harder part—the social acceptability of different policies — remains in the hands of politicians and the broader political process.

Of course, others will have slightly different lists. Our point is that a wider

21 NOVEMBER 2013 | VOL 503 | NATURE | 33.5 © 2013 Macmillan Publishers Limited. All rights reserved

- 1. Differences and chance cause variation
- 2. No measurement is exact
- 3. Bias is rife
- 4. Bigger is usually better for sample size
- 5. Correlation does not imply causation
- Regression to the mean can mislead
- 7. Extrapolating beyond the data is risky
- 8. Beware the base-rate fallacy
- 9. Controls are important
- 10. Randomization avoids bias
- 11. Seek replication, not pseduoreplication
- 12. Scientists are humans
- 13. Significance is significant
- 14. Separate no effect from non-significance
- 15. Effect size matters
- 16. Study relevance limits generalization
- 17. Feelings influence risk perception
- 18. Dependencies change the risks
- 19. Data can be dredged or cherry picked
- 20. Extreme measurements may mislead

## **Underlying issues**

- Poor training
- Poor evaluation
- Difficulty in publishing negative findings
- Perverse reward incentives

~\$30,000!

Learned Publishing, 24:95–97 doi:10.1087/20110203

Table 1 Monetary reward system in Zhejiang University

Journal classification	Monetary award	
Nature or Science	200,000 RMB (first author); decreased by 50% according to the sequence of authors	
SCI journals (first author)		
IF < 1	2,000 RMB	
$1 \le IF < 3$	3,000 RMB	
$3 \le IF < 5$	4,000 RMB	
$5 \le IF < 10$	5,000 RMB	
$IF \ge 10$	14,000 RMB	
EI journals (first author)	1,800 RMB	
ISTP (first author)	600 RMB	

## Principles for addressing the underlying issues

- Raise community awareness
- Enhance formal training
- Protect quality of funded and published research with a more systematic review process
- Address issues of pressure and stability for investigators

### **Trans-NIH actions**

- NIH is discussing reproducibility and transparency of research findings with stakeholder communities to alert them to the issues and solicit feedback.
- Office of Intramural Research is creating and will pilot a new module on research integrity, as it relates to experimental biases and study design, to ethics training course required for NIH intramural fellows. This expected to be ready for testing in the Spring.
- Once tested, the Office of Extramural Research will make available on the web and encourage adoption (or equivalent) by extramural training programs for fellows and trainees.

## Trans-NIH actions Implementation of pilots

- NIH will implement pilots to address to key concerns:
  - Evaluate the "scientific premise" of grant applications
  - Develop a checklist to ensure more systematic evaluation of grant applications
  - Determine approaches needed to reduce "perverse incentives", e.g.
    - Design changes to bio-sketch requirements
    - Longer-term support for investigators
  - Support replication studies

## Trans-NIH actions Implementation of pilots

- NIH will implement pilots to address to key concerns
- Important issues to consider as the pilots developed:
  - One size does not fit all
  - Effects on experienced vs. early-career researchers
  - Costs of additional data
  - Potential added burden to review process

#### **PubMed Commons Blog**

Keeping you up to date about PubMed Commons



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GETTING STARTED

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#### PubMed Commons going public soon

Posted on November 26, 2013



It's been a month since the beta launch of PubMed Commons, the pilot system that enables authors' discussion and sharing of information about publications in PubMed.

The first public version of the PubMed Commons pilot will be released in the coming weeks. All users of PubMed will be able to see and cite comments.

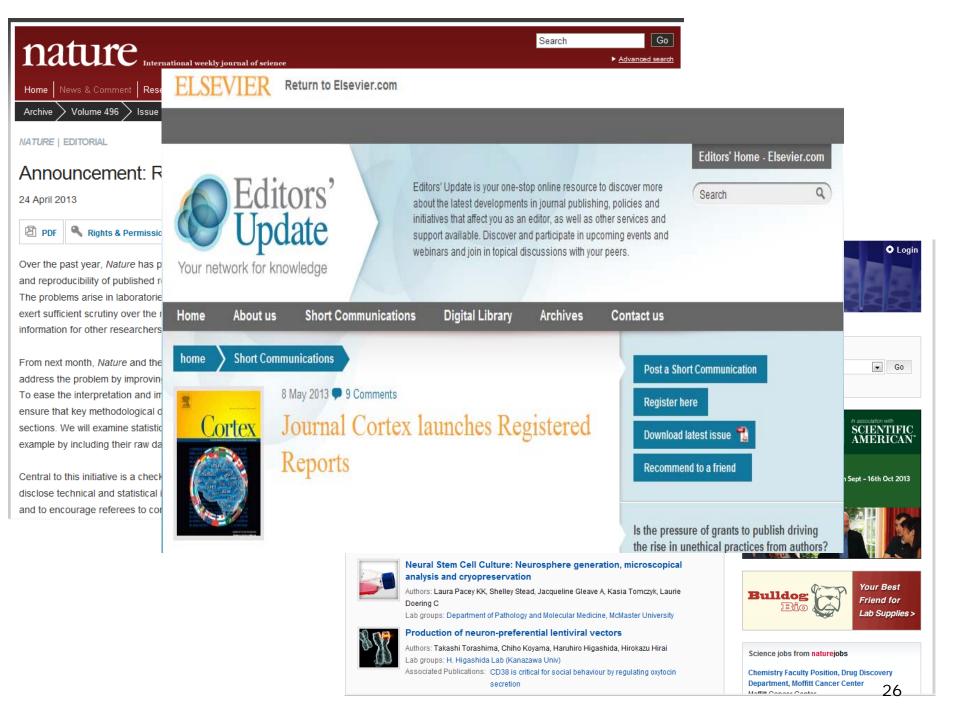


### Trans-NIH actions (cont.)

 Convene meeting of Study Section Chairs, Board of Scientific Counselors (BSC) Chairs

### Trans-NIH actions (cont.)

- Convene meeting of Study Section Chairs,
   Board of Scientific Counselors (BSC)
   Chairs
- Invite Journal Editors to meeting to discuss common opportunities





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#### Elsevier Announces Article Retraction from Journal Food and Chemical Toxicology

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"Long term toxicity of a Roundup herbicide and a Roundup-tolerant genetically modified maize," by Gilles Eric Séralini et al. has been retracted by the journal Food and Chemical Toxicology

#### Cambridge, MA, November 28, 2013

Elsevier announces that the article "Long term Eric Séralini et al. has been retracted by the jo

Food and Chemical Toxicology 50 (2012) 4221-4231

The journal has issued the following retraction

The journal Food and Chemical Toxicology re modified maize," which was published in this of the published article and the data it reports making any public statements regarding this a



Contents lists available at SciVerse ScienceDirect

#### Food and Chemical Toxicology

journal homepage: www.elsevier.com/locate/foodchemtox



paper. According to the journal's standard pra genetically modified maize made; however, it is in accordance with the jo wishes to acknowledge the co-operation of the process.

### Very shortly after the publication of this article, Long term toxicity of a Roundup herbicide and a Roundup-tolerant described, the proper use of animals, and eve

response from the authors.[1] Due to the natu Gilles-Eric Séralini a,\*, Emilie Clair a, Robin Mesnage a, Steeve Gress a, Nicolas Defarge a, review process and requested permission fro Manuela Malatesta b, Didier Hennequin c, Joël Spiroux de Vendômois a

<sup>a</sup> University of Caen, Institute of Biology, CRIIGEN and Risk Pole, MRSH-CNRS, EA 2608, Esplanade de la Paix, Caen Cedex 14032, France so requested.[2] The corresponding author ac buniversity of Verona, Department of Neurological, Neuropsychological, Morphological and Motor Sciences, Verona 37134, Italy <sup>c</sup>University of Caen, UR ABTE, EA 4651, Bd Maréchal Juin, Caen Cedex 14032, France

#### ARTICLE INFO

Article history: Received 11 April 2012 Accepted 2 August 2012 Available online 19 September 2012

Keywords: GMO Roundup NK603 Glyphosate-based herbicides Endocrine disrupting effects

#### ABSTRACT

The health effects of a Roundup-tolerant genetically modified maize (from 11% in the diet), cultivated with or without Roundup, and Roundup alone (from 0.1 ppb in water), were studied 2 years in rats. In females, all treated groups died 2-3 times more than controls, and more rapidly. This difference was visible in 3 male groups fed GMOs. All results were hormone and sex dependent, and the pathological profiles were comparable. Females developed large mammary tumors almost always more often than and before controls, the pituitary was the second most disabled organ; the sex hormonal balance was modified by GMO and Roundup treatments. In treated males, liver congestions and necrosis were 2.5-5.5 times higher. This pathology was confirmed by optic and transmission electron microscopy. Marked and severe kidney nephropathies were also generally 1.3-2.3 greater. Males presented 4 times more large palpable tumors than controls which occurred up to 600 days earlier. Biochemistry data confirmed very significant kidney chronic deficiencies; for all treatments and both sexes, 76% of the altered parameters were kidney related. These results can be explained by the non linear endocrine-disrupting effects of Roundup, but also by the overexpression of the transgene in the GMO and its metabolic consequences. © 2012 Elsevier Ltd. All rights reserved.

### Trans-NIH actions (cont.)

- Convene meeting of Study Section Chairs,
   Board of Scientific Counselors (BSC)
   Chairs
- Invite Journal Editors to meeting to discuss common opportunities
- Continue dialogue with stakeholders professional societies, industry, academics, patient advocacy groups

## **Extramural Research Community**



#### Reproducibility Initiative receive landmark cancer studies

October 16, 2013 | Posted by Elizabeth in Science Exch











The COS advocates openness, integrity, and reproducibility of scientific research.



Rewarding Reproducible Re

#### For Scientists

COS maintains the Open Science Framework to archive, share, register, and manage the research lifecycle. COS supports the Open Science Collaboration, develops tools to enable open practices, and provides grants for replications and other projects.

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#### For Journals, Funders, and Societies

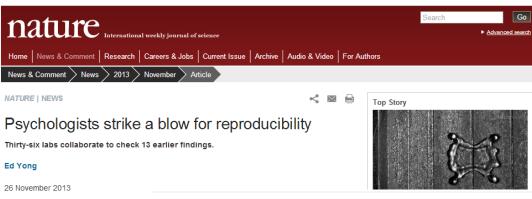
COS supports infrastructure for preregistration and open practices, produces badges to incentivize open practices, maintains back-end tools for journals, and provides grants for open innovations.

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Read more



Many Labs Replication Project repeated 13 psychological studies using 6,344 volunteers from 12 countries

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A large international group set up to test the reproduced the results of 10 out of 13 past could not be reproduced.

Psychology has been buffeted in recent ye after repeated failures to replicate classic s study was flawed, the new experiment was settings or groups of people.

To tackle this 'replicability crisis', 36 resear Labs Replication Project to repeat 13 psyc consortium combined tests from earlier exp. questionnaire — meant to take 15 minutes it to 6,344 volunteers from 12 countries.

The team chose a mix of effects that repres psychological science, from classic experin repeatedly replicated to contemporary one

Ten of the effects were consistently replica These included classic results from econor

Anchoring (Jacowitz & Kahneman, 1995) - Babies Anchoring (Jacowitz & Kahneman, 1995) - Everest Allowed/Forbidden (Rugg, 1941) Anchoring (Jacowitz & Kahneman, 1995) - Chicago-Anchoring (Jacowitz & Kahneman, 1995) - NYC-Corr. between I and E math attitudes (Nosek et al., 2002) Retro. gambler's fallacy (Oppenheimer & Monin, 2009) Gain vs loss framing (Tversky & Kahneman, 1981) Sex diff. in implicit math attitudes (Nosek et al., 2002) Low-vs.-high category scales (Schwarz et al., 1985) Quote Attribution (Lorge & Curtis, 1936) Norm of reciprocity (Hyman and Sheatsley, 1950)-Sunk costs (Oppenheimer et al., 2009) Imagined contact (Husnu & Crisp, 2010)-Flag Priming (Carter et al., 2011) Currency priming (Caruso et al., 2013)

Sample US Intl. Original Effect Size х -1.00.00 1.00 2.00 3.00 Standardized Mean Difference (d)

10 of the effects were consistently replicated

## **Complementary NIH efforts**

- Ongoing projects separate from and/or complementary to the proposed pilots
  - NIH has and continues to collaborate with the Association for Psychological Science (APS) and the American Psychological Association (APA) on new and enhanced journal reporting standards (e.g., expanded Methods sections, addition of statistical sections).
  - NIA: Supports the Interventions Testing Program, where preclinical studies are conducted with multisite duplication, rigorous methodology and statistical analysis.

## Complementary NIH efforts (cont.)

- Ongoing projects separate from and/or complementary to the proposed pilots
  - NHGRI: Expectations of validation studies are an inherent part of the review of functional genomics studies and bioinformatics tool development.
  - NIDDK: Supports Mouse Metabolic Phenotyping Centers, which provide the scientific community with standardized, high-quality phenotyping services.
  - NINDS: Established a Scientific Rigor Working Group to forge action plans for rigor-focused efforts.









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## Turning Discovery Into Health



